

# Hierarchical process model discovery algorithm for CRS systems

Andrzej STROIŃSKI<sup>1</sup> , Dariusz DWORNIKOWSKI<sup>2</sup> , Anna KOBUSIŃSKA<sup>1</sup> , and Jerzy BRZEZIŃSKI<sup>1</sup> 

<sup>1</sup> Institute of Computing Science, Poznan University of Technology, Poznań, Poland

<sup>2</sup> Bitropy, Poland

**Abstract.** An increasing number of distributed systems are currently being developed according to the REST paradigm, supporting a diverse range of services and applications. However, analyzing potential errors and deviations in their operation has become progressively more difficult due to both the scale of processed data and the proliferation of available services. In this context, process mining offers a valuable approach. By analyzing event logs collected from such systems, it is possible to derive process models that represent application behavior in distributed environments. These models support the identification and remediation of errors as well as the optimization of system performance. This article introduces a mechanism for representing process models of communication resource systems (CRS) developed within the REST paradigm using process algebra. In addition, we propose an algorithm for discovering such models, enabling the identification of both local processes executed within individual services and the interactions that occur between them.

**Keywords:** process mining; data discovery; process modeling; distributed systems; CRS systems.

## 1. INTRODUCTION

RESTful Web services have become the dominant architectural choice for both emerging startups and major enterprises on the Web. Several factors contribute to this trend. The simplicity of REST lowers the entry barrier for service development, while its lightweight nature makes system management more straightforward compared to “heavy” SOAP-based systems (SOAP – Simple Object Access Protocol). Furthermore, RESTful web services align seamlessly with the fabric of the Web, as they are natively integrated with the ubiquitous HTTP protocol that underpins Internet communication. REST (Representational State Transfer) is also particularly well-suited to the development of both internal and external APIs. This is especially relevant in microservices architectures, where applications are composed of small, loosely coupled, and replaceable services that communicate through language-agnostic APIs. In such environments, microservices interact with one another through HTTP and RESTful APIs. In the following discussion, we refer to this class of systems, designed according to ROA (resource-oriented architecture) or REST principles, as communicating resource systems (CRS).

CRSs are inherently granular, API-driven, and composed of numerous independent services. Their complexity does not primarily stem from the functionality of individual components but from the intricate interactions, dependencies, and coordination

across many small and relatively simple services via APIs. This phenomenon can be described as a “complexity shift”. While the behavior of a single service may be understandable and verifiable against its design, assessing the system as a whole raises more difficult questions. From a global perspective, determining whether the system behaves according to its intended design or whether its overall behavior conforms to the APIs it exposes, becomes a significant challenge.

We argue that process mining techniques, particularly conformance checking [1], offer a promising direction for addressing this challenge. Conformance checking focuses on identifying deviations between the observed system behavior, reconstructed from event logs, and a predefined reference model. Such a model may be provided directly by an expert or derived from API specifications and documentation. However, existing process mining approaches [1], including both process discovery and conformance checking, generally operate under the assumption that the process of interest is flat (a so-called 2D analysis). In this view, even if the process is composed of multiple subprocesses, these remain indistinguishable and are not explicitly represented in the discovered model. While this assumption is often adequate for enterprise-level business processes, it becomes limiting when analyzing systems characterized by inherent process composition or hierarchical structures. Recently, the emergence of object-centric event logs (OCEL) [2] has drawn increasing attention, together with more advanced discovery techniques capable of exploiting such data [3–6]. These methods enable the capture of more complex and multidimensional processes. Nevertheless, they still lack explicit semantics for describing communication patterns and process composition, which are crucial for understanding the behavior of distributed and service-oriented systems.

\*e-mail: [andrzej.stroinski@put.poznan.pl](mailto:andrzej.stroinski@put.poznan.pl)

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For communicating resource systems (CRS), more suitable modeling approaches are required. These systems consist of numerous small processes, hierarchically composed and interacting to realize larger, global business processes. Consequently, it is essential to adopt modeling techniques capable of capturing their distinctive characteristics, namely compositionality, modularity, the presence of subprocesses, and communication. In our previous work on process mining for communicating systems built on REST principles [7, 8], we demonstrated that classical Petri nets are inadequate for fully representing such systems. Specifically, Petri nets lack compositionality, are inherently flow-oriented rather than behavior-oriented, and cannot directly model communication, which is a fundamental building block of every distributed system.

We therefore argue that symbolic process calculi are better suited for modeling CRSs. By design, they are compositional, naturally support the representation of subprocesses, emphasize communication and behavioral aspects, and can be readily adapted to specific domains. Collectively, these features reduce the representational bias of models employed in process mining [1, 9].

In this article, we introduce *ROC*, a process calculus designed to model communicating resource systems (CRS), including distributed systems based on REST, RESTful business processes, ROA systems, Web Services, and related architectures. *ROC* represents a natural evolution of the earlier  $RA_s$  algebra proposed in [10], which provided an elementary calculus but lacked mechanisms for data passing and explicit HTTP communication. In contrast, *ROC* is fully equipped to represent systems that rely on HTTP as their underlying protocol. We further propose the AMA-WC (algebra miner algorithm with communication) algorithm, which enables the discovery of CRS process models from their execution histories. Such histories are typically captured in the event logs of CRS components (e.g., services). Unlike an ideal model, which represents the intended system behavior, the discovered model reflects the actual behavior observed during execution. The AMA-WC algorithm derives process models expressed in the *ROC* calculus.

The remainder of this article is organized as follows. Section 2 provides a brief overview of related work. Section 3 introduces the *ROC* calculus, presenting its syntax, semantics, and illustrative examples. Section 4 describes the AMA-WC algorithm for discovering *ROC* models from event logs. The evaluation of the proposed algorithm and analysis of the obtained results are presented in Section 5. Finally, Section 6 concludes the paper with a summary of contributions.

## 2. RELATED WORK

Regarding conformance checking, no prior work explicitly addresses resource-oriented systems such as REST or ROA. Existing studies mainly concern SOAP-based Web Services. For example, [11] extracts behavioral models from BPEL definitions for comparison with logs, though the approach lacks hierarchy and explicit communication. Related work verifies choreography in SOA systems [12], uses reference architectures [13], or

applies event calculus [14]. More recent contributions, such as [15], propose constraint-based conformance with CxWSDL. However, these approaches remain tied to SOAP and emphasize the flow perspective. Privacy-aware federated conformance checking [16] enables cross-organizational analysis but similarly neglects the resource perspective.

Process calculi for SOA systems have also been widely studied [17–23], though these treat services as black boxes and lack support for hierarchical composition. A comprehensive survey is available in [21]. For resource-based systems, the most relevant work is [24], which applies temporal logic to verify RESTful properties, but without behavioral modeling or hierarchy.

Process mining has been applied in distributed systems, but few algorithms explicitly address hierarchical and communicative processes. In [25], the authors propose a method for distributed discovery of CRS models by analyzing component interactions, experimentally demonstrating its effectiveness in uncovering communication structures. Applications to Web services are explored in [26], which highlights the use of event logs for process design and monitoring, and in [27], which introduces a hybrid genetic service mining (HGSM) method for large-scale, distributed logs.

Adaptation to resource-oriented systems is discussed in [7], which emphasizes the need to extend SOAP-focused methods to RESTful architectures, presenting initial work on process discovery in this domain. The problem of evolving Web APIs is addressed in [28], where usage-log mining reveals behavioral patterns guiding API evolution, with applications in education and healthcare. Finally, [29] proposes hierarchical process tree discovery, distinguishing business from event logs, emphasizing the importance of identifying hierarchical relationships that arise from task dependencies during execution. The proposed method, based on hierarchical process trees, supports the discovery of models with subprocess relationships. However, this work focuses solely on hierarchical structures, without addressing communication or message-passing aspects.

Several studies propose domain-agnostic algorithms for process discovery, but they fail to capture the hierarchical dependencies characteristic of CRS systems. In [30], different Petri net classes are evaluated for modeling collaboration processes, with a meta-model and design guidelines proposed. Building on this, [31] presents Collaboration Miner (CM), which identifies collaboration processes directly from event logs without predefined assumptions. Another approach, fuzzy mining [32], simplifies unstructured models by using adaptive, multi-perspective views, which apply to domains such as healthcare, logistics, and web services.

In addition, [33] surveys methods for handling complex processes but does not address compositionality or inter-process communication.

In summary, existing work advances conformance checking and process discovery in SOAP-based or domain-agnostic settings, but a gap persists for CRS and REST systems. Current approaches are limited to Petri nets or flow-oriented models, highlighting the need for algebra-based methods as a foundation for new frameworks in process analysis and conformance checking.

### 3. RESOURCE ORIENTED CALCULUS (ROC)

The primary entities in CRSs are resources, which are accessed through method invocations transmitted over a communication protocol. Upon invocation, a resource executes a sequence of activities that constitute its behavior or process, defining the actions required in response to a request. Consequently, CRS resources are inherently reactive: they engage in activities only when explicitly invoked. In practical terms, resources can be understood as programs that are executed upon method calls.

Figure 1 presents a graphical representation of the CRS model. The boxes are resources, and the arcs represent communication among them. The primary characteristic of the system is that resources are hierarchical, meaning that resources can be placed within other resources. Some distinguished resources are *top resources*, e.g.,  $id1, id3, id4$ , some of them are *sub-resources* of other resources, e.g.,  $id2$  in  $id1, id7$  in  $id6$ . In the latter example,  $id2$  is also a direct sub-resource of  $id1$  because it is directly underneath it in the hierarchy. *Sub-resources* cannot belong to more than one top resource. In addition, top resources and all resources belonging to the same "level" in one enclosing top resource have to be uniquely named. So, in CRS, resources are uniquely addressable, and every resource has its name or id, e.g.,  $id1$ . Hierarchy in addressing is expressed similarly to the URI standard as paths. In the given example, the path for the resource  $id7$  would be  $id5/id6/id7$ .

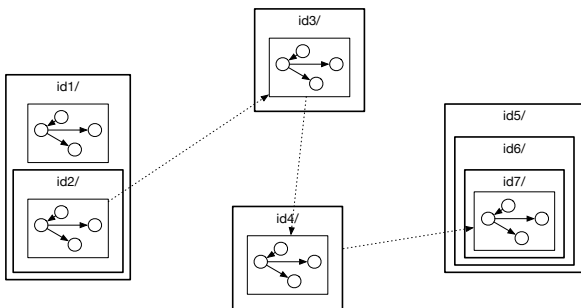


Fig. 1. Model of a communicating resource system

The communication model of CRS is synchronous, analogous to HTTP, meaning that a corresponding response is immediately sent after every request. Accordingly, each communication activity in CRS is represented as a request–response pair. Communication is both directed and addressed: when a resource issues a request to another resource, it must explicitly identify the target resource along its path. For example, a resource  $/client/$  may send a request  $req$  to a resource  $/user/$ . Since resources in CRS are reactive, system execution is always initiated by an external message. The originator of this initiating message is referred to as the client. A client may either be an internal component of the CRS (i.e., another resource) or an assumed external entity.

In the following, we formally define the CRS model and its properties.

#### Definition 1. CRS model

CRS is a tuple  $\langle R, I, A, \alpha, \eta, \theta, \triangleleft \rangle$ , where:  
 $R$  – is a set of resources.

$I$  – is a set of resource identifiers (e.g., URI address).

$A$  – is a set of all activity names that resources can execute.

$\alpha$  – is a relation that assigns activities ( $A$ ) that can be performed by a resource  $r$ ,  $\alpha \subseteq (R \times A)$ .

$\eta$  – is a surjective function  $\eta : R \rightarrow I$  that assigns identifiers from  $I$  to resources from  $R$ .

$\theta$  – is a surjective function  $\theta : OPS \rightarrow RETS$  that assigns return codes from a set of response codes  $RETS$  to request methods activities from  $OPS \subseteq A$ .

$\triangleleft$  – is strict partial order hierarchy relation  $\triangleleft$  where  $\triangleleft \subseteq (R \times R)$ .

The model in Def. 1 was loosely inspired by [24], in addition to it, let us denote  $id(r) = i$  for  $(r, i) \in \eta$  and  $r \in R, i \in I$ . The hierarchy is expressed by the relation  $\triangleleft$ , and based on that, we will now define concepts related to and resulting from that: *sub-resource* and *super resource* (Def. 2), *Top resource* (Def. 3), *Unique belonging* (Def. 4), *Direct sub-resource* and *Direct super resource* (Def. 5).

#### Definition 2. Sub-resource and super resource

Whenever  $(r_1, r_2) \in \triangleleft$  for some  $r_1, r_2 \in R$  and  $r_1 \neq r_2$ , we say that  $r_1$  is a **sub-resource** of  $r_2$ , and we write  $r_1 \triangleleft r_2$ . We will call  $r_2$  a **super resource** of  $r_1$ .

#### Definition 3. Top resource

A resource  $t$  is a **top resource** if  $\forall r \in R : (t, r) \notin \triangleleft$ . A set of top resources is denoted as  $\mathcal{T}, \mathcal{T} \subseteq R$ .

#### Definition 4. Unique belonging

**Unique belonging** denotes that  $\forall r_1, r_2, r_3 \in R$  if  $r_1 \triangleleft r_2$  and  $r_1 \triangleleft r_3$  and  $r_2, r_3 \in \mathcal{T}$  then  $r_2 = r_3$ .

#### Definition 5. Direct sub-resource

$\forall r_1, r_2 \in R$ : if  $r_1 \triangleleft r_2, r_1 \neq r_2$  and  $\nexists r_3 \in R : r_1 \triangleleft r_3 \triangleleft r_2$ , then we call  $r_1$  a **direct sub-resource** of  $r_2$  and write  $r_1 \triangleleft_1 r_2$ .

#### Definition 6. Top resource naming uniqueness

$\forall r_1, r_2 \in \mathcal{T}, r_1 \neq r_2$  and  $i_1, i_2 \in I$ , if  $id(r_1) = i_1, id(r_2) = i_2, r_1 \neq r_2$  then  $i_1 \neq i_2$ .

#### Definition 7. Direct super resource naming uniqueness

$\forall r_1, r_2, r_3 \in R$ , if  $r_1 \triangleleft_1 r_3$  and  $r_2 \triangleleft_1 r_3$  and  $r_1 \neq r_2$  and  $id(r_1) = i_1$  and  $id(r_2) = i_2$  then  $i_1 \neq i_2$ .

#### Definition 8. Resource addressing

Let us define a *path* function:

$$path(r_1) = \begin{cases} id(r_1) & \text{if } r_1 \in \mathcal{T}, \\ path(r_2) \cdot \text{"/"} \cdot id(r_1) & \text{if } r_1 \triangleleft_1 r_2. \end{cases}$$

where  $\cdot$  is a string concatenation.

A communication in CRS can be defined as a quadruple:

#### Definition 9. Communication in CRS

A communication in CRS is a tuple  $\langle path(R_s), path(R_d), o, r \rangle$ , written  $R_s \xrightarrow{o, r} R_d$ , where:

$path(R_s)$  – is the path address of the requesting resource, called source resource ( $R_s \in R$ ).

$path(R_d)$  – is the path address of the requested resource called destination resource ( $R_d \in R$ ).

$o \in OPS$  – is the operation invoked by  $R_s$  on  $R_d$ .

$r \in RETS$  – is a return code to the operation  $o$ .

An example of a communication in CRS, as defined in Def. 9, could be  $/client/ \xrightarrow{READ, OK} /counters/counter$ . In this hypothetical example, some resource `client` sends `READ` request to the `/counters/counter`, resulting in a return code `200 OK`.

In the case of *ROC*, the sets *OPS* and *RETS* are fixed to correspond to the methods and return codes of the HTTP protocol. Specifically, *OPS* includes the standard HTTP methods, e.g., *GET, POST, PUT, DELETE, HEAD*. For brevity, we do not enumerate the full set of 36 HTTP return codes as specified in RFC7231; instead, we assume that *RETS* encompasses all of them (e.g., 202 Accepted, 200 OK, 404 Not Found, 301 Moved Permanently, etc.).

*ROC* introduces a possibility of simple data passing in a communication. For this, we employ notation inspired by that in [20]. Let *Var* be a set of all variables ranged over by  $x, y, z$  and *Val* be a set of values ranged over by  $v$ . In order to represent tuples we exploit notations  $\vec{x} = \langle x_0, x_1, \dots, x_i \rangle$  and  $\vec{y} = \langle y_0, y_1, \dots, y_i \rangle$ . To access a particular variable in a tuple, we exploit  $\rightarrow$  notation, e.g., variable  $x_2$  in  $\vec{x}$  is  $\vec{x} \rightarrow x_2$ .

A hierarchical nature of resource-based systems is expressed by the id guard  $@l$ , which allows for embedding other guards, making it possible to express  $P := l[m[n[\dots]]]$ . In the example,  $l$  is a top resource id ( $id(t_0) = l$  for some  $t_0 \in \mathcal{T}$ ),  $@m, @n$  are sub-resource ids ( $id(r_0) = m, id(r_1) = n, r_0, r_1 \in R, r_0 \leq t_0, r_1 \leq t_0, r_1 \leq t_1$ ). Now, let us define the syntax of the *ROC* using BNF grammar:

$$\begin{aligned}
 & a, b, c, \dots \in A, \quad \bar{o} \in OPS, \\
 & r \in RETS \quad l, m, n, \dots \in I \quad x, y, z \in Var \\
 & P, Q ::= @l[P] | \mathbf{stop} | P + Q | P || Q | a.P | comm \\
 & comm ::= \bar{o}@m(\vec{x}, \vec{y}).P | o_l(\vec{x}).P | \bar{o}_{\uparrow r}(\vec{x}).P
 \end{aligned}$$

**stop** denotes the null process, i.e., a process that exhibits no behavior. The operator  $P + Q$  represents alternative composition (choice), meaning that either  $P$  executes or  $Q$ . The prefixing construct  $a.P$  indicates that the process first executes action  $a$  and then continues as  $P$ . For brevity, we permit omission of **stop** in terminating processes; for example,  $a.b.c$  is syntactically equivalent to  $a.b.c.\mathbf{stop}$ . Finally,  $P || Q$  denotes parallel composition, where the executions of  $P$  and  $Q$  proceed in an interleaved manner.

Communication in *ROC* is inspired by HTTP and is therefore synchronous: each request is blocked until a corresponding response with a return code is returned. The receiving process may perform arbitrary internal computations between receiving the request and issuing the response. This mechanism enables *ROC* to represent subprocesses and orchestration, where one process invokes another and thereby initiates an entire processing chain.  $\bar{o}@m(\vec{x}, \vec{y})$  is a request that sends an operation and is blocked until a response comes, to a response getting operation  $\bar{o}_{\uparrow m}$  operation.  $m$  is an “address” of the requested remote resource (e.g., `/patients/`, or `/user/111`);  $\vec{x}$  is a request structure, with request body and headers, whereas  $\vec{y}$  is where the response structure (again body and headers, and a response code) will be written to.  $o_l(\vec{x})$  is where a request is received and  $\bar{o}_{\uparrow r}(\vec{z})$  is the

response to the request with  $r$  return code, which will finally unblock the sender. We will exploit  $_$  to denote an empty data structure. A simplified communication diagram can be seen in Fig. 2. Data structures are omitted for simplicity.

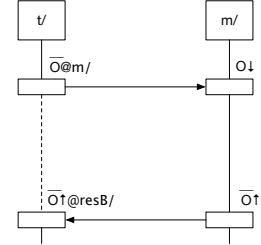


Fig. 2. Communication in *ROC*

Figure 3 presents labeled transition systems (LTS) semantics of *ROC* calculus,  $t_0, t_1 \in \mathcal{T}, a \in A, o \in OPS, r \in RETS$ . Most rules state that transitions can happen in a single top resource. Within it, however, behavior is still free to shift from one sub-resource to another. *SEQ* are rules governing prefixing, *ALT* rules deal with the situation where a process makes a non-deterministic choice inside a top resource. *PAR* rules define behavior for parallel composition similarly to *ALT* rules, considering all possible cases. Finally, the *COM* rule covers communication, where two processes in two different resources communicate on a channel, resulting in a silent activity defined as  $\tau$ .

$$\begin{aligned}
 \text{SEQ} & \frac{}{t[a.P \xrightarrow{a} stop]} \quad \frac{}{t[a.P \xrightarrow{a} P]} \\
 \text{ALT} & \frac{t[P \xrightarrow{a} P'] \quad t[Q \xrightarrow{a} Q']}{t[P+Q \xrightarrow{a} P']} \quad \frac{t[P \xrightarrow{a} P'] \quad t[Q \xrightarrow{a} Q']}{t[P+Q \xrightarrow{a} Q']} \\
 \text{PAR} & \frac{t_i[P \xrightarrow{a} P']}{t_i[P] || t_j[Q] \xrightarrow{a} t_i[P'] || t_j[Q]} \quad i \neq j \\
 & \frac{t_i[Q \xrightarrow{a} Q']}{t_i[P] || t_j[Q] \xrightarrow{a} t_i[P] || t_j[Q']} \quad i \neq j \\
 \text{COM} & \frac{t_j[Q \xrightarrow{a} stop] \quad t_i[P \xrightarrow{a} stop]}{t_i[P] || t_j[Q] \xrightarrow{a} t_i[P]} \quad i \neq j \quad \frac{t_i[P \xrightarrow{a} stop] \quad t_j[Q \xrightarrow{a} stop]}{t_i[P] || t_j[Q] \xrightarrow{a} t_j[Q]} \quad i \neq j \\
 & \frac{t[\bar{a}@m(\vec{x}, \vec{y}).P \xrightarrow{\bar{a}@m(\vec{x}, \vec{y})} a_{\uparrow m}(\vec{y}).P]}{m \not\leq t} \\
 & \frac{t_i[P \xrightarrow{\bar{a}@m(\vec{x})} P'] \quad t_j[Q \xrightarrow{a_{\downarrow}(\vec{y}/\vec{x})} Q']}{t_i[P] || t_j[Q] \xrightarrow{\tau} t_i[P'] || t_j[Q']} \quad m \leq t_j, i \neq j \\
 & \frac{t_i[P \xrightarrow{a_{\uparrow} @m(\vec{y})} P'] \quad t_j[Q \xrightarrow{\bar{a}_{\uparrow r}(\vec{x})} Q']}{t_i[P] || t_j[Q] \xrightarrow{\tau} t_i[P'] || t_j[Q']} \quad m \leq t_j, i \neq j
 \end{aligned}$$

Fig. 3. Transition rules for *ROC*

Example 1 presents a simple load balancer that, upon an incoming request  $GET$  from some assumed Client (not covered in this example), directs the request to one of two servers,  $serv_1$  or  $serv_2$ .

**Example 1.** A simple load balancer

$$\begin{aligned}
 LB &:= lb[GET_1(\_).GET@serv_1(\_, resp).save(resp).GET_{\tau_{200} OK}(resp2) \\
 &+ GET_1(\_).GET@serv_2(\_, resp).save(resp).GET_{\tau_{200} OK}(resp2)] \\
 Server_1 &:= serv_1[GET_1(\_).process.GET_{\tau_{200} OK}(resp)] \\
 Server_2 &:= serv_2[GET_1(\_).process.GET_{\tau_{200} OK}(resp)] \\
 System &:= Client || LB || (Server_1 || Server_2)
 \end{aligned}$$

#### 4. ROC ALGEBRA MODEL DISCOVERY

In this section, we introduce the algebra miner algorithm with communication mining (AMA-WC), an extension of Guido Schimm's algorithm (GS) [34,35]. The algorithm comprises two main components: (i) the discovery of local processes (AMA-WC-LOC, Section 4.2), and (ii) their composition into a global process through communication (AMA-WC-GLB, Section 4.3). Below, we briefly outline the key differences between AMA-WC and the original GS algorithm:

- Whereas GS discovers models in a general-purpose process algebra, AMA-WC is tailored to the more expressive ROC calculus. This enables explicit representation of process composition via inter-process communication (see Section 4.3); for example, task delegation can be modelled as request–response interactions.
- AMA-WC (Section 4.3) yields a compositional system model: multiple interacting local process models are composed into a global model. Consequently, it identifies both process composition and the communication between processes.
- AMA-WC operates on the ROC calculus using an extended graph notation, formally captured by communication blocks with explicit sender and receiver nodes (see Section 4.3).
- GS assumes lifecycle-aware logs (explicit start/end events for each activity) to infer concurrency. In contrast, AMA-WC accommodates the reality that most CRS logging (and typical service frameworks, e.g., [36–39]) records point events at occurrence time only. Accordingly, AMA-WC introduces alternative concurrency definitions (see Defs. 10, 11). In addition, we formalize algebra graphs and present a step-by-step construction method.

##### 4.1. Formal notation and theoretical foundations

To describe the event log, we exploit the notation from [40].  $L$  is an event log of a system, and is a multi-set of event sequences ( $\sigma$ ), e.g.,  $L = \{\sigma_1^7, \sigma_2^2, \dots, \sigma_n^m\}$ , where the  $n$ -th sequence occurs  $m$  times in  $L$ . Event sequences consist of ordered events ( $e$ ), e.g.,  $\sigma = \langle e_1, e_2, e_3, e_4, e_5 \rangle$ . Furthermore, each event can consist of multiple data fields, where one is distinguished as an identifier of the event. We assume the id's uniqueness in  $L$ . To select a specific event field, we use  $\#_{field\_name}(e)$ , e.g.,  $\#_{id}(e_1) = first\_event$ , means event  $e_1$  has  $id$  set to  $first\_event$ . We

distinguish two types of events: local resource events (LRE), and communication resource events (CRE). The difference between them is the minimal set of available attributes that must be recorded. LRE needs information about the executing resource, as well as the event id. In addition, if the ordering relation in the event log is not fulfilled, then timestamps must also be present. CRE, in addition to attributes present in LRE, needs information about the source and destination of communication. Such data is extremely difficult to get in practice; however, an approach to this problem can be found in our previous work [7].

##### 4.2. PART 1: Algebra miner algorithm with communication mining – local process discovery

In the GS algorithm, it is assumed that the event log is represented in interval form. In this representation, each activity is described by two partial events: a start event, which marks the initiation of the activity, and an end event, which marks its completion. Interval logs facilitate straightforward detection of parallelism: informally, if the time intervals of two activities overlap, the activities are considered parallel. Consequently, for two activities to be classified as parallel, the conditions specified in Def. 10 must be satisfied.

**Definition 10. (Interval activity parallel relation)** Let  $a, b \in E$  (where  $E$  are events set in  $L$ ),  $a||b \iff \#(a)_{start} \succ \#(b)_{start} \succ \#(a)_{end} \vee \#(a)_{start} \succ \#(b)_{end} \succ \#(a)_{end} \vee \#(a)_{start} \succ \#(b)_{start} \succ \#(b)_{end} \succ \#(a)_{end}$

In addition:  $a||b = b||a$ .

This relation, however, does not apply to CRS systems due to the way modern application servers record logs. Typically, each resource generates only a single log entry per invocation, containing information about the request sent and the response received from the remote resource. The same limitation applies to standard local application logs, which typically do not record event durations or start–end event pairs. Consequently, it is necessary to adopt the classical ordering relation introduced in [40] (Def. 11) and apply it to the generation of trace clusters. Under this relation, two events  $a$  and  $b$  are considered parallel if, in at least one trace,  $a$  directly precedes  $b$ , and in at least one other trace,  $b$  directly precedes  $a$ .

**Definition 11. (Classical activity parallel relation)** Let  $a, b \in E$ ,  $a||b \iff a \succ_L b \wedge b \succ_L a$  (where  $E$  are events set in  $L$ ).

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##### Listing 1. AMA-WC: discovery of local process

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```

1: function AMA-WC-LOC(L)
2:   el = remove_redundant_traces(L)
3:   init_clusters = gen_init_clusters(el)
4:   ord_set = gen_ord_set(el)
5:   pll_set = gen_pll_set(ord)
6:   clusters = gen_pll_clusters(init_clusters, pll_set)
7:   clusters = gen_init_algebra_model(clusters)
8:   algebra = reduce_model(clusters)

```

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With this background, we now introduce the general idea of AMA-WC-LOC, illustrated in Listing 1. The procedure begins

by processing the event log  $L$  to remove redundant traces, i.e., traces that occur more than once. The result of this step is an event log without repeated traces, denoted as  $el$  (Fig. 4, l. 2). In the second step, initial trace clusters are generated based on all non-redundant traces (Fig. 4, l. 3). A simple implementation of this procedure is presented in Listing 2.

In this implementation, we iterate over traces in the event log (Listing 2, l. 3), creating a new Node for each event (l. 7). For each trace, a new cluster is generated (l. 4). If the current event is the first event of the trace (l. 8), the node is added to the cluster (l. 9). For subsequent events, we update the outgoing nodes of the previous node ( $prev.out$ ) and the incoming nodes of the current node ( $curr.in$ ) accordingly (l. 11–13). Finally, the completed cluster is added to the set of clusters (l. 15).

### Listing 2. Generating initial trace clusters

```

1: function GEN_INIT_CLUSTERS( $el$ )
2:   clusters = set()
3:   for all  $\sigma \in el$  do
4:     curr_cluster = new cluster()
5:     prev = None
6:     for all  $e \in \sigma$  do
7:       curr = new Node( $e$ )
8:       if  $e == first(\sigma)$  then
9:         curr_cluster.addNode(curr)
10:      else
11:        prev.out.add(curr)
12:        curr.in.add(prev)
13:        curr_cluster.addNode(curr)
14:        prev = curr
15:      clusters.add(curr_cluster)
16:   return clusters

```

The next step of AMA-WC-LOC (Listing 1, l. 4) involves computing the set of tuples  $(a, b)$ , where each tuple denotes that event  $a$  directly precedes event  $b$  in at least one trace. Based on this set ( $ord_{set}$ ) and Def. 11, the algorithm derives the set of parallel events ( $pll_{set}$ ) (l. 5). Subsequently, in l. 6, parallel clusters are generated and redundant ones are removed. As shown in Listing 3, the algorithm iterates over previously generated clusters (l. 2) and the ordering relations within those clusters (l. 3). The purpose of this iteration is to determine whether the dependency between two events represents a sequential or a parallel relation. Following Def. 11, if the reverse ordering relation is found in other traces (and thus in other clusters), the two events are recognized as parallel. Accordingly, in l. 4, the algorithm checks whether the events are parallel; if so, a new cluster is created where the tested events are connected by a parallel relation rather than a sequential one (l.s 5–9). The original cluster is then removed.

An example of this transformation is presented in Fig. 4, l. 6. In this case, clusters *emphB* and *C* are both transformed into their parallel counterparts, *B'* and *C'*. Since *B'* and *C'* are identical, the duplicates are removed, leaving a single cluster, denoted as *D*.

In l. 9 of Listing 3, redundant duplicate clusters are removed. Finally, in l.s 7 and 8 of Listing 1, a workflow algebra model is

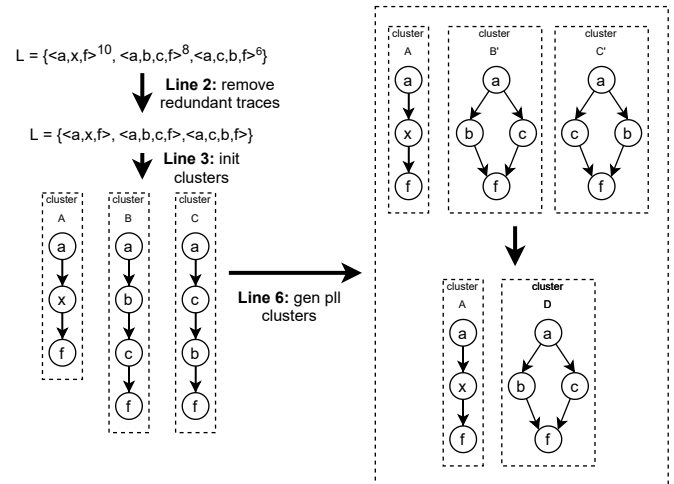


Fig. 4. AMA-WC-LOC: preparing clusters for initial algebra

### Listing 3. Generate parallel clusters

```

1: function GEN_PLL_CLUSTERS( $clusters, pll_{set}$ )
2:   for all  $c \in clusters$  do
3:     for all  $e_1 > e_2 \in c$  do
4:       if  $(e_1, e_2) \in pll_{set}$  then
5:          $c' = c.copy()$ 
6:          $e'_1.out = e'_2.out$ 
7:          $e'_2.in = e'_1.in$ 
8:         clusters.add( $c'$ )
9:         clusters.del( $c$ )
10:        clusters = remove_duplicate_clusters(clusters)
11:   return clusters

```

discovered from the generated clusters. These steps correspond directly to Steps 4 and 5 of the original GS algorithm [34] and remain unchanged. However, for the sake of completeness, we briefly describe their implementation in our framework using algebra graphs and present the semantics of this structure for subsequent use. To this end, we introduce several definitions of the workflow algebra model: 12, 13, 14, 15, 16, 17, 18, and 19.

**Definition 12. (Algebra graph)** Alpha graph  $AG$  is a tuple  $\langle N, E \rangle$ , where  $N$  is a set of algebra graph nodes and  $E$  is a set of directed edges.

**Definition 13. (Algebra graph node)** An algebra graph node is a tuple  $\langle id, IN, OUT, RELATED \rangle$ , where  $id$  is a unique node identifier,  $IN$  is a set of input nodes,  $OUT$  is a set of output nodes, and  $RELATED$  is a node related to the current node.

**Definition 14. (Algebra simple node (sequence))** Algebra sequence node is a tuple  $seq = \langle id, IN, OUT, RELATED \rangle$ , where  $|IN| = 1$ ,  $|OUT| = 1$ ,  $|RELATED| = 0$ . The semantics of this node are as follows: execute this node action, when iff all  $seq.IN$  nodes have already been executed and go to the next ( $n.OUT$ ) node.

**Definition 15. (Algebra parallel start node (APSN))** Algebra parallel start node is a tuple  $pll_{start} = \langle id, IN, OUT, RELATED \rangle$ , where  $|IN| = 1$ ,  $|OUT| = x$  ( $x \geq 1$ ),  $RELATED = n$  ( $n$  is APEN node). The semantics of this node are as follows: execute this node action,

when iff all  $pll_{start}.IN$  nodes have already been executed and go to the all ( $pll_{start}.OUT$ ) node at the same time.

**Definition 16. (Algebra parallel end node (APEN))** Algebra parallel end node is a tuple  $pll_{end} = \langle id, IN, OUT, RELATED \rangle$ , where  $|IN| = x$  and ( $x \geq 1$ ),  $|OUT| = 1$ ,  $RELATED = n$  ( $n$  is APSN node). The semantics of this node are as follows: execute this node action, when iff all  $pll_{end}.IN$  nodes have already been executed and go to the next ( $pll_{end}.OUT$ ) node.

**Definition 17. (Algebra alternative start node (AASN))** Algebra alternative start node is a tuple  $alt_{start} = \langle id, IN, OUT, RELATED \rangle$ , where  $|IN| = 1$ ,  $|OUT| = x$  ( $x \geq 1$ ),  $RELATED = n$  ( $n$  is AAEN node). The semantics of this node are as follows: execute this node action, when iff all  $alt_{start}.IN$  nodes have already been executed and go to only one node from the set  $alt_{start}.OUT$ .

**Definition 18. (Algebra alternative end node (AAEN))** Algebra alternative end node is a tuple  $alt_{end} = \langle id, IN, OUT, RELATED \rangle$ , where  $|IN| = x$  and ( $x \geq 1$ ),  $|OUT| = 1$ ,  $RELATED = n$  ( $n$  is AASN node). The semantics of this node are as follows: execute this node action, when iff only one node from set  $alt_{end}.IN$  nodes have already been executed and go to the next ( $alt_{end}.OUT$ ) node.

**Definition 19. (Algebra graph edge)** Alpha graph edge is a pair  $(a, b)$ , where  $a \in E \wedge b \in E \wedge a \in b.IN \wedge b \in a.OUT$

The initial algebra model is constructed from the clusters obtained in Step I (Listing 4). In line 2, a new algebra instance is created. Subsequently, the starting node of the discovered process (l. 3) and the first node (an alternative node) are generated. The purpose of this construction is to associate each possible ordering of events, as derived from the clusters, with an alternative node. This is realized by creating the node (l. 4). The ordering between these two nodes is then established by an edge (l. 7) and recorded in the appropriate sets (l. 5 and 6). Analogous operations are performed for the termination nodes of both the alternative node and the process (l. 9–14). Specifically, the process end node and the closure of the alternative node are added. Additionally, lines 15–16 record relationships between nodes, specifying which nodes serve as closures of others. The current state of the algebra model at this stage is illustrated in Fig. 5a.

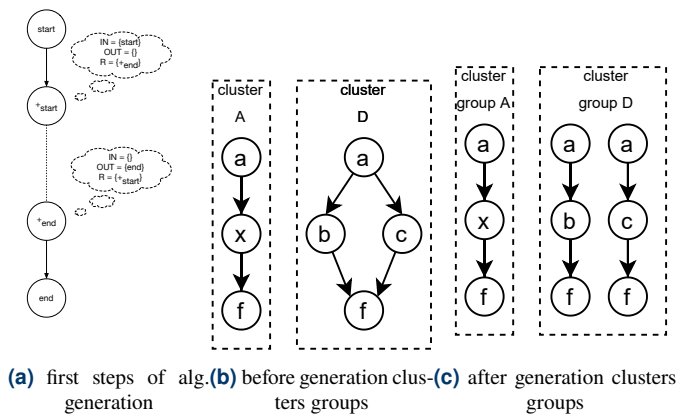


Fig. 5. Graphical notation of clusters

#### Listing 4. Generate initial algebra model

```

1: function GEN_INIT_ALGEBRA_MODEL(clusters)
2:   alg = new Algebra()
3:   alg.N += new Node(start, 0, 0, 0)
4:   alg.N += new Node(+1start, 0, 0, 0)
5:   start.OUT += +1start
6:   +1start.IN += start
7:   alg.E += (start, +1start)
8:   alg.first = start
9:   alg.N += new Node(end, 0, 0, 0)
10:  alg.N += new Node(+1end, 0, 0, 0)
11:  end.IN += +1end
12:  +1end.OUT += end
13:  alg.E += (+1end, end)
14:  alg.last = end
15:  +1end.R += +1start
16:  +1start.R += +1end
17:  clusters_groups += gen_all_traces(clusters)
18:  for all cg ∈ clusters_groups do
19:    ||cg.idxstart = new Node(||cg.idxstart, {+1}, 0, 0)
20:    +1end.OUT += ||cg.idxstart
21:    ||cg.idxstart.IN += +1
22:    alg.E += (+1, ||cg.idxstart)
23:    for all c ∈ cg do
24:      seq = gen_seq_events(c)
25:      alg.N += nodes(seq)
26:      alg.E += edges(seq)
27:      first(seq).IN += ||cg.idxstart
28:      ||cg.idxstart.OUT += first(seq)
29:      alg.E += (||cg.idxstart, first(seq))
30:      last(seq).OUT += ||cg.idxend
31:      ||cg.idxstart.IN = last(seq)
32:      alg.E += (last(seq), ||cg.idxend)
33:  return clusters

```

All possible traces are generated from the clusters (l. 17). These traces are additionally grouped by their originating clusters, emphasizing that they correspond to parallel executions of events. The outcome of this step is illustrated in Figs. 5b and 5c, where the left side depicts clusters before execution and the right side shows the clusters after execution. For each cluster group, a parallel node is then generated (l. 19) and connected to the alternative node (l. 20–22). Each cluster is subsequently translated into a sequence of events (l. 24), resulting in a sequence of sequence nodes. The function *first* returns the initial node of the sequence, while *last* returns the final node. These nodes are then connected to the respective parallel start and end nodes. Finally, an ending alternative node is created and linked to the parallel end nodes of all clusters, followed by the creation of the global process end node. The resulting algebra graph is presented in Fig. 6a.

The next step of the algorithm, following the generation of the initial algebra model (Fig. 6a), is its reduction (Listing 5). The first operation excludes nodes that appear immediately before parallel complex nodes (l. 5). Specifically, the goal is to identify identical nodes (whether complex or simple) that directly succeed the parallel start node and remove them before it.

Three possible cases of this transformation are illustrated in Figs. 7–8. In the first case (Fig. 7a), all succeeding nodes are

**Listing 5.** Reduce model

```

1: function REDUCE_MODEL(algebra)
2:   changed = True
3:   while changed do
4:     changed = False
5:     (changed, algebra) = exclude_before_pll(alg)
6:     (changed, algebra) = exclude_after_pll(alg)
7:     (changed, algebra) = exclude_before_alt(alg)
8:     (changed, algebra) = exclude_after_alt(alg)
9:   return algebra
    
```

identical. Here, the redundant nodes can be straightforwardly excluded, as shown in Fig. 7b.

The second case arises when there are multiple identical nodes preceding the parallel start node, but at least one additional node differs (Fig. 7c). In this situation, subsets of identical succeeding nodes (denoted as *subset1*) must be identified. For each such subset, a new parallel complex node ( $\parallel_2start$ ) is introduced and placed between the nodes of the subset ( $x_1, x_1$ ) and the original parallel start node ( $\parallel_1start$ ). The new parallel start node must also be paired with a corresponding end node ( $\parallel_2end$ ), and the appropriate connections are added. To complete this, the algorithm identifies paths (e.g.,  $x_1, y_1$ ) leading from the newly added node ( $\parallel_2start$ ) to the last nodes ( $k, k$ ) before the original parallel end node ( $\parallel_1end$ ).

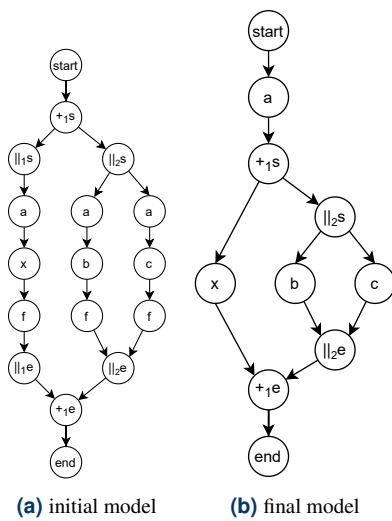


Fig. 6. Algebra graph model

The same principle is applied to exclude nodes following the parallel end node (l. 6); however, only examples are provided without detailed discussion. The variants are illustrated in Figs. 9a, 9c, and 8a. In this case, instead of analyzing the successors of the parallel start node, the algorithm considers the predecessors of the parallel end node. In the first variant (Fig. 9a), the transformation produces the result shown in Fig. 9b. The second variant, which involves identifying subsets of identical events, is illustrated in Fig. 9c with the result shown in Fig. 9d. The third variant is analogous to the case of excluding nodes before the parallel start node (Fig. 8).

The same reduction steps are applied to alternative algebra nodes instead of parallel ones (l. 7 and 8).

All of the above steps are executed iteratively in a loop (l. 3) until no further structural changes occur in the algebra graph. This is necessary because even a small transformation may enable additional reductions. An example of the resulting graph is presented in Fig. 6b.

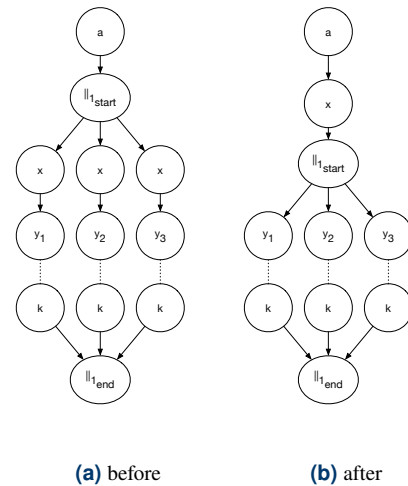


Fig. 7. Exclusion before parallel start node (a and b variant I), (c and d variant II)

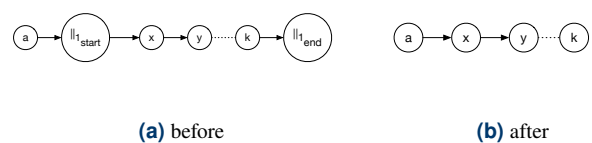


Fig. 8. Exclusion before parallel start node and exclusion after parallel end node (variant III)

## Hierarchical process model discovery algorithm for CRS systems

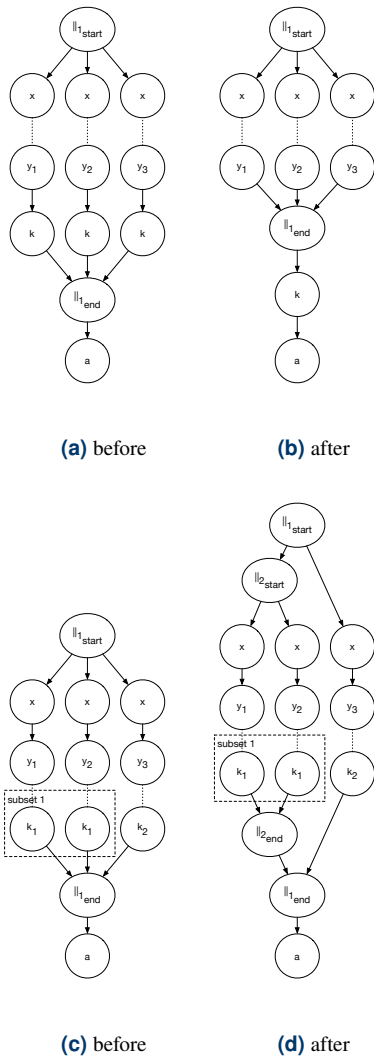


Fig. 9. Exclusion after parallel end node (a and b variant I), (c and d variant II)

#### 4.3. PART 2: Algebra miner algorithm with communication mining – AMA-WC-GLB

In this part of the algorithm, we demonstrate how to derive a hierarchical *ROC* model applicable to CRS. To achieve this, we extend AMA-WC-LOC by introducing an additional pre-processing step and a post-processing step.

##### 4.3.1. Step I: CRS system event collection and session reconstruction

The first step of AMA-WC-GLB is to collect event logs from the CRS and link the corresponding invocations of different resources into coherent process instances. To this end, we assume that system resources are capable of recording two types of events: local events (Def. 20) and communication events (Def. 21).

**Definition 20. (Local resource event)** Local resource event is a tuple  $LRE = \langle event\_id, res\_id, context \rangle$ , where:  $event\_id$  – is a locally resource unique event identifier.

$res\_id$  – is a globally unique resource identifier.  
 $context$  – is a locally unique local process case identifier.

**Definition 21. (Communication resource event)** Communication resource event (CRE) is a tuple:

$\langle event\_id, res\_id, context, h\_ctx, source\_uri, dest\_uri \rangle$

where:

$event\_id$  – is a locally unique resource event identifier.

$res\_id$  – is a globally unique resource identifier.

$context$  – is locally unique local process case identifier.

$h\_ctx$  – context of resource that invoked resource that stores that data.

$source\_uri$  – communication source resource URI address.

$dest\_uri$  – communication destination resource URI address.

and  $event\_id \neq \emptyset, res\_id \neq \emptyset, context \neq \emptyset, source\_uri \neq \emptyset, dest\_uri \neq \emptyset$ .

The event log of a CRS system contains both types of events. By applying the context-ordering relation defined in Def. 22 together with our earlier session reconstruction algorithm for CRS [7], we can associate resource invocations with the corresponding local events executed during their processing (i.e., the local process of a resource, Def. 23). This integration produces global process instances (Def. 24), resulting in the construction of the global system event log (*GEL*).

**Definition 22. (Context ordering relation)**  $a \succ_{ctx} b$  iff there is trace in event log where  $\#_{ctx}(a) = \#_{hctx}(b) \wedge \#_{res}(a) = resA \wedge \#_{res}(b) = resB$ , where  $resA, resB \in Res \wedge resA \neq resB$ , where  $Res$  is a set of all resources in the system, and  $\#_{ctx}(e) = A$  is a value of field  $ctx$  of event  $e$  is  $A$ .

**Definition 23. (Local process)** Local process is a process executed at one resource of CRS during its invocation.

**Definition 24. (Global process)** Global process is a process executed in the system that involves communication between multiple resources of that system.

##### 4.3.2. Step II and III: mining the local process of each resource

In this stage, we extract the local processes of each resource in the system using AMA-WC-LOC (see Section 4.2). First, as shown in Listing 6, the global event log obtained in Step I is reorganized into a collection of resource-specific logs (l. 2). Then, for each resource represented in the *GEL*, we apply AMA-WC-LOC and add the resulting algebra to the set of CRS algebras (*AG*) (l. 3).

##### Listing 6. Mining local processes

```

1: function MINE_LOCAL_PROCESSES(GEL)
2:   RL[] = organize_log_into_res(EL)
3:   for all rl ∈ RL do
4:     AG += AMA-WC-LOC(rl)
5:   return AG

```

The example of a result of this step is shown in Fig. 10.

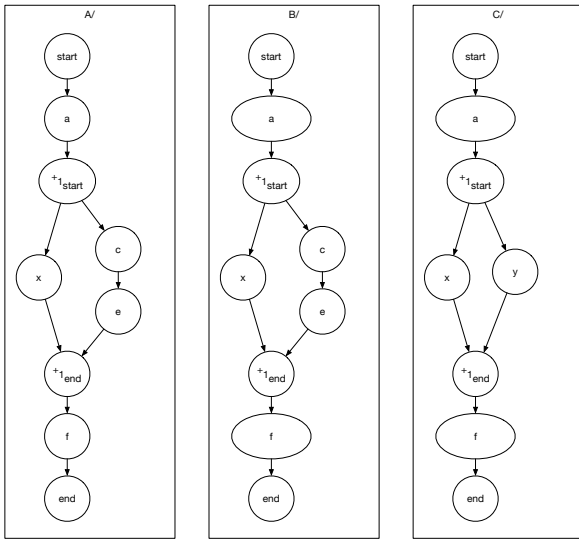


Fig. 10. Discovered model without communication

#### 4.3.3. Step IV: Mining communication

Finally, communication events are identified based on the local invocation relation (Def. 25), the global invocation relation (Def. 26), and the approach introduced in our earlier work [8,25].

**Definition 25. (Local invocation)**  $a \succ_{l.inv} b$  iff  $a$  is an event of sending message  $x$  and  $b$  is an event of receiving a response to the message  $x$  where  $\#_{res}(a) = \#_{res}(b)$ .

The local invocation relation (Def. 25) represents events corresponding to the invocation of an external resource during execution and the subsequent receipt of a response, from the perspective of the invoking resource. This relation connects the two events (nodes in the algebra) by a direct arc, since a response cannot occur without a preceding request. As a result, the local process model can be analyzed independently of the global process, i.e., with communication abstracted away.

**Definition 26. (Global invocation)**  $a \succ_{g.inv} b$  iff  $a$  is an event of sending message  $x$  and  $b$  is an event of receiving the message  $x$ , where  $\#_{res}(a) \neq \#_{res}(b)$ .

The global invocation relation (Def. 26) specifies the direction of workflow during external resource invocations, enabling the connection of interacting processes within the system. For example,  $a \succ_{g.inv} b$  denotes that  $a$  is a message-sending event generated by one resource, while  $b$  is the corresponding receiving event at another resource. Here,  $\#_{res}(e)$  refers to the resource property of event  $e$  in the log.

Within the algebraic model, the algorithm identifies communication events at the invoker side and groups them into communication blocks (Def. 27). Sequential nodes (Def. 13) are then replaced with *recACN* nodes (Def. 28) and *resACN* nodes (Def. 29) at the receiver side. In addition, the communication block and both communication nodes are connected by a communication edge between them (*ACG.CE*) (Def. 31).

**Definition 27. (Communication block)** Communication block denotes the invocation and response handling events and is a tuple  $cb = \langle id, n_{send}, n_{receive}, DATA \rangle$ , where  $n \in SEQ$  and  $SEQ$  is a set of sequence nodes of algebra and  $id$  is the identifier of the event in the form of a concatenation of the operation used to invoke and destination which is invoked by this communication. The semantics of this block are as follows: a message is sent when  $n_{send}$  is executed, and a response is received when  $n_{receive}$  is executed. The  $DATA_{send}$  and  $DATA_{receive}$  contain information about sent and received codes, headers, body, etc.

**Definition 28. (Algebra communication node (receiver) – recACN)**

Algebra communication node (receiver) node, which denotes the entry point for invocation by some remote resource. *recACN* is a tuple  $\langle id, IN, OUT, RELATED, DATA \rangle$ , where  $|IN| = 1$ ,  $|OUT| = 1$ ,  $|RELATED| = 1$ ,  $|commIN| = 1$ . The semantics of this node are as follows: execute this node action, when iff all *seq.IN* nodes have already been executed, and the message was sent by node *commIN* (this node was executed). *DATA* element contains all information sent in the HTTP request, like headers, body, etc.

**Definition 29. (Algebra communication node (responder) – resACN)**

Algebra communication node (responder) node is a tuple  $seq = \langle id, IN, OUT, RELATED, commOUT, DATA \rangle$ , where  $|IN| = 1$ ,  $|OUT| = 1$ ,  $|RELATED| = 0$ ,  $|commOUT| = 1$ . The semantics of this node are as follows: execute this node action and send a message to node *commOUT*. *DATA* element contains all information sent in the HTTP request, like response code, headers, body, etc.

**Definition 30. (ROC process algebra graph – RAG)** *ROC* process algebra graph is a process algebra graph where some of the sequential nodes are also: *recACN* and *resACN* nodes.

**Definition 31. (Algebra communication graph – ACG)**

Algebra communication graph is a directed graph structure  $\langle A, B, CE \rangle$ , where  $A$  is a set of *ROC* process algebras (RAG),  $B$  is a set of communication blocks, and  $CE$  is a set of communication edges in the form  $(a, b)$  which denotes that node  $a$  is sending the message to node  $b$ . Here, the element of set  $A$  without any incoming edges from set  $CE$  is considered the starting point of the system processing described by *ACG* and is denoted *ACG.start*.

Listing 7 presents the *mine\_global\_process* procedure used in this step. First, the algorithm searches for communication entries in each resource log (l. 4) within the algebra groups (*ACG*) (l. 3). When the condition in l. 5 is satisfied (i.e., the local invocation relation holds), a communication block is added to the algebra graph (l. 6).

The semantics of the method are as follows:  $gMTH(a)$  retrieves the HTTP invocation method of event  $a$ ;  $destURI(a)$  retrieves the destination URI of event  $a$ ; and  $gNode(a, alg)$  returns the node with identifier  $a$  from algebra  $alg$ . Next, the algorithm verifies that the global ordering relations are satisfied within the algebra communication graph (*ACG*). For any pair of events that fulfil this relation, an edge is created in the *ACG* to represent the corresponding communication.

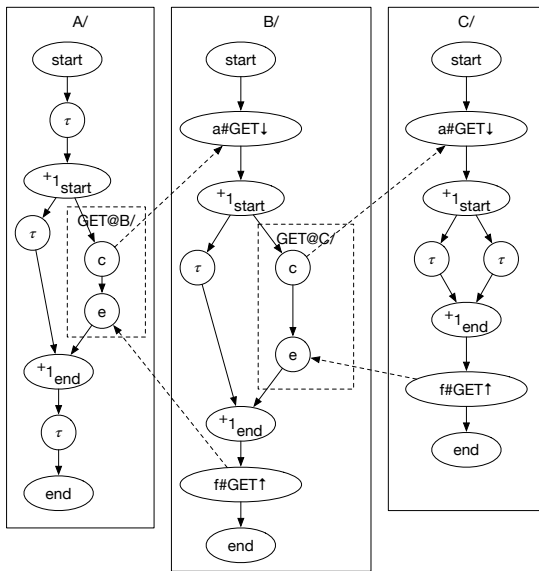
**Listing 7.** Mining global process

```

1: procedure mine_global_process(AG)
2:   ACG.A = AG
3:   for alg ∈ ACG do
4:     for rl ∈ alg do
5:       if a  $\succ_{l.inv}$  b  $\wedge$  a ∈ rl  $\wedge$  b ∈ rl then
6:         ACG.B += { gMTH(a) + "@" + destURI(a), gNode(a, alg),
gNode(b, alg) }
7:   for alg1 ∈ ACG do
8:     for alg2 ∈ ACG do
9:       for n1 ∈ alg1.N do
10:        for n2 ∈ alg2.N do
11:          if a  $\succ_{g.inv}$  b then
12:            ACG.CE += (gNode(a, alg1), gNode(b, alg2))
13: return ACG

```

After applying this step to model 10, the resulting Algebra communication graph *ACG* shown in graphical notation is depicted in Fig. 11.



**Fig. 11.** Discovered model with communication

## 5. EVALUATION AND TESTS

In this section, we present the evaluation of the proposed algorithm along with a performance analysis of the developed method.

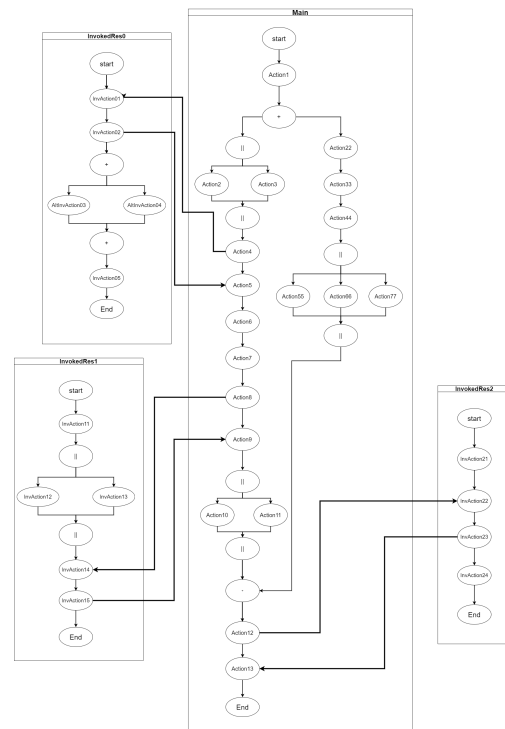
To assess its effectiveness, we designed dedicated test environments (Figs. 12, 13, and 15), where event logs were generated in accordance with the contextual logging framework introduced in [7].

It is essential to note that AMA-WC requires complete event logs [40], meaning that no noise is allowed to be present. Consequently, all incomplete local and global processes were excluded from the evaluation. It is worth noting that there are studies that address noise and errors in the log, e.g., [41, 42], which makes it possible to apply this method also in such situations.

The experiments were conducted on a machine with the following configuration: Intel Core i7-5820K CPU @ 3.30 GHz, 16 GB RAM, 1 TB SSD storage, and Windows x64 operating system. Each test involved constructing a hierarchical process composed of communicating local processes, generating the corresponding context logs, and subsequently filtering and transforming these logs into CSV format. The prepared logs were then used as input to the algorithm.

### 5.1. Process quality and complexity

Let us first discuss the quality and complexity of process model discovery in AMA-WC, using as an example a simple global process composed of four subprocesses (see Fig. 12).



**Fig. 12.** Hierarchical CRS process discovered by AMA-WC

The experimental setup consisted of a central process invoking three subordinate processes. Each process incorporated standard control-flow constructs supported by the target process algebra, including parallelism, exclusive choice, and communication. The objective of this experiment was to demonstrate that AMA-WC can accurately discover the designed process algebra, independently identify local processes, and, by exploiting contextual information, reconstruct the communication between them.

It is important to emphasize that, when provided with a complete event log of the CRS system, the proposed method is capable of discovering the exact process model expressed in the *ROC* process algebra. The procedure for obtaining such logs was outlined in the introduction to Section 5.

From the perspective of computational complexity, the discovery of local models is grounded in Schimm's algorithm,

which exhibits exponential complexity. In CRS systems, however, the processes executed by individual resources are typically not highly complex; the overall complexity arises primarily from the cooperation and interaction of these processes within the global system. The key factor is therefore the complexity of the communication discovery step. This step is implemented using dictionary operations, which have an average-case complexity of  $O(1)$  and a worst-case complexity of  $O(n)$ , where  $n$  is the number of dictionary elements.

As a result, the communication discovery step exhibits a multi-linear time complexity: linear in each parameter, but dependent on the product of these parameters.

In the following sections, we examine how the communication context in two distinct composition scenarios influences process discovery time, and we compare communication discovery time with the time required for global process discovery.

### 5.2. TEST 1: Performance tests for orchestrated process

In the first test, a process was designed to orchestrate all other processes within the example CRS system (Fig. 13).

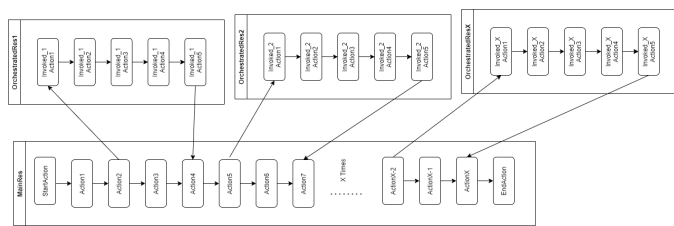


Fig. 13. Test 1: Orchestrated process example

The purpose of this test was to evaluate a scenario in which a single process sequentially invokes subsequent processes. To minimize the influence of local process complexity on the performance of global process discovery, straightforward, non-branching processes were deliberately chosen.

Each experiment was executed ten times, and the results were averaged.

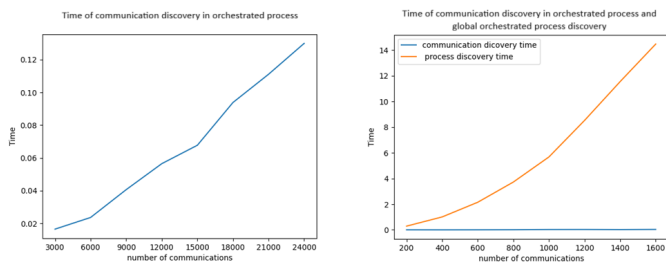


Fig. 14. Test 1: Time for communication discovery (left) and time of global process discovery (right)

As illustrated in Fig. 14, the algorithm as a whole exhibits exponential complexity, whereas the communication discovery step remains linear and accounts for only a small fraction of the total execution time.

### 5.3. TEST 2: Performance tests for nested communication

The second test (Fig. 15) examined a scenario with nested local processes.

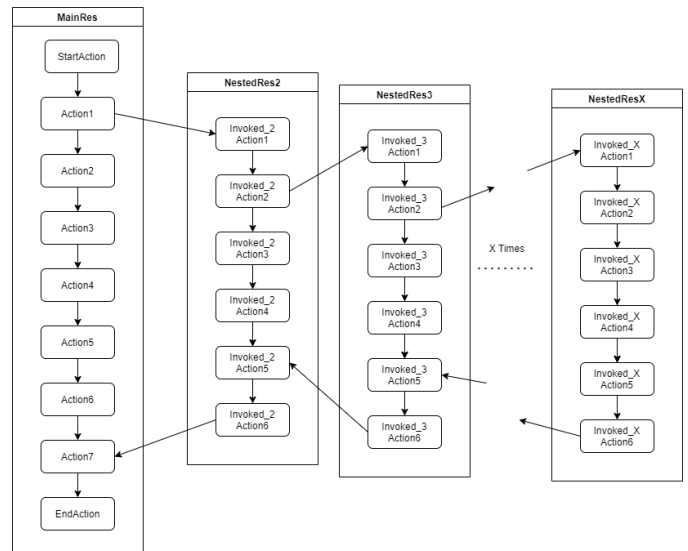


Fig. 15. Test 2: Nested process example

In this setup, each process is invoked by another process and, in turn, invokes an additional one, resulting in a strictly nested structure where successive processes are embedded within one another. As in the previous experiment, each test was executed ten times, and the results were averaged.

The results (Fig. 16) confirm that, in this scenario as well, the time required for communication discovery constitutes only a small fraction of the total process discovery time.

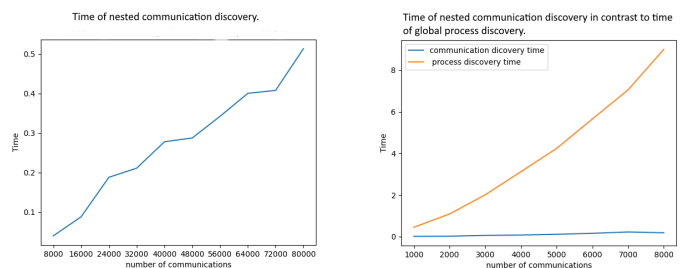


Fig. 16. Test 2: Time for communication discovery (left) and time of global process discovery (right)

### 5.4. Test summary

The performance and complexity analysis demonstrate that incorporating composition and communication does not substantially increase the time required for process discovery using the proposed hierarchical algorithm. On the contrary, the approach reduces discovery time compared to scenarios in which the global process is mined as a single entity, without decomposition or communication. In AMA-WC, the exponential complexity applies only to local processes rather than the global process, which considerably lowers the overall time required to discover the global CRS process. Moreover, the discovery

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of individual local processes can be distributed across multiple resources, further decreasing the total discovery time. Only the step of identifying inter-process connections needs to be performed in a centralized manner.

## 6. CONCLUSIONS AND FUTURE WORK

In this paper, we introduced the *ROC* process calculus, a formal language for modeling communicating resource systems. The calculus captures both the hierarchical structure of such systems and the communication between their resources.

We then proposed an extension of the GS algorithm, enabling the discovery of process models expressed in *ROC* and supporting non-interval event logs. This enhancement broadens applicability to systems implemented with widely used technologies. A further extension allowed us to reconstruct complex processes composed of multiple interacting subprocesses by explicitly modeling communication. While the approach assumes access to contextual logs, prior studies show that such logs can be derived without reimplementing the system.

Overall, the proposed method advances process discovery in CRS systems by explicitly addressing communication and composition. Although our work is centered on CRS and REST systems, the approach is transferable to other domains such as organizational workflows, logistics, and scheduling—provided contextual logs are available. The increasing adoption of OCEL further simplifies this requirement, making contextual log extraction feasible through pre-processing alone. Designing such a pre-processing algorithm, validated with a practical case study, is a promising avenue for future work.

Another direction for further research is extending AMAWC to incorporate event frequency, quantifying the strength of dependencies between activities. Such a heuristic extension would improve robustness against noise and enable the analysis of typical rather than only idealized process behavior.

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ChatGPT (OpenAI) was employed for minor language editing, such as text proofreading, correcting grammar and typographical errors. No AI tools were used in the conceptualization or analysis of the research.

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